

# Using GV Field Campaign Data to Improve GPM Algorithm Assumptions

Stephen W. Nesbitt<sup>1</sup>, Paloma Borque<sup>1</sup>, Joseph A. Finlon<sup>1</sup>, Randy J. Chase<sup>1</sup>, and Greg M. McFarquhar<sup>2</sup>

<sup>1</sup>Department of Atmospheric Sciences, University of Illinois at Urbana-Champaign, Urbana, IL, USA

<sup>2</sup>CIMMS/School of Meteorology, University of Oklahoma, Norman, OK, USA

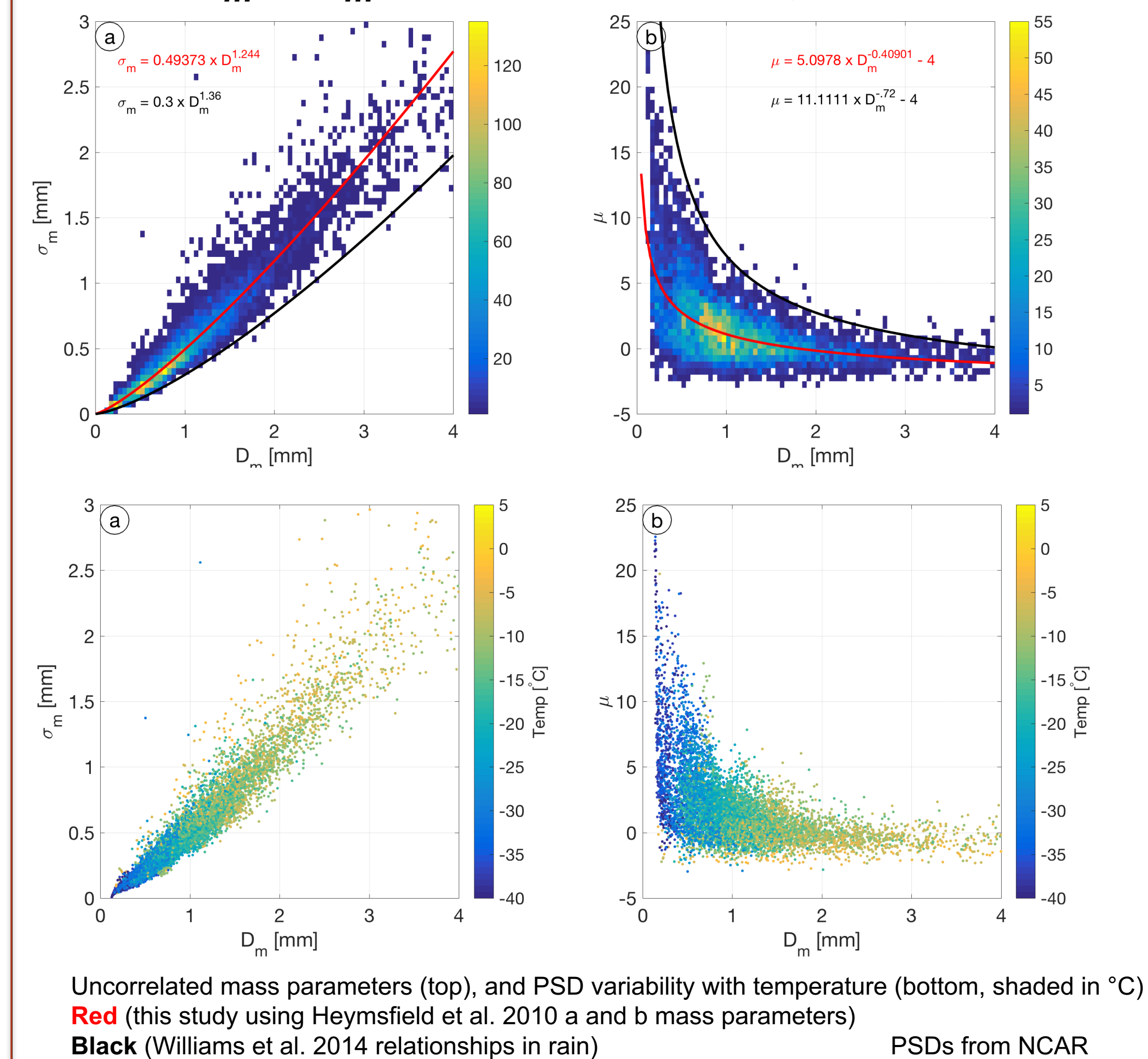


Here, we address two key assumptions of GPM retrieval algorithms in ice-phase precipitation using GCPEX, MC3E, and OLYMPEx UND Citation and radar observations:

1) Parameterization of ice cloud particle size distributions (PSDs): *Use the Williams et al. (2014)  $\sigma_m - D_m$  framework to retrieve  $\mu$  using statistically uncorrelated estimates* (Borque et al., in prep)

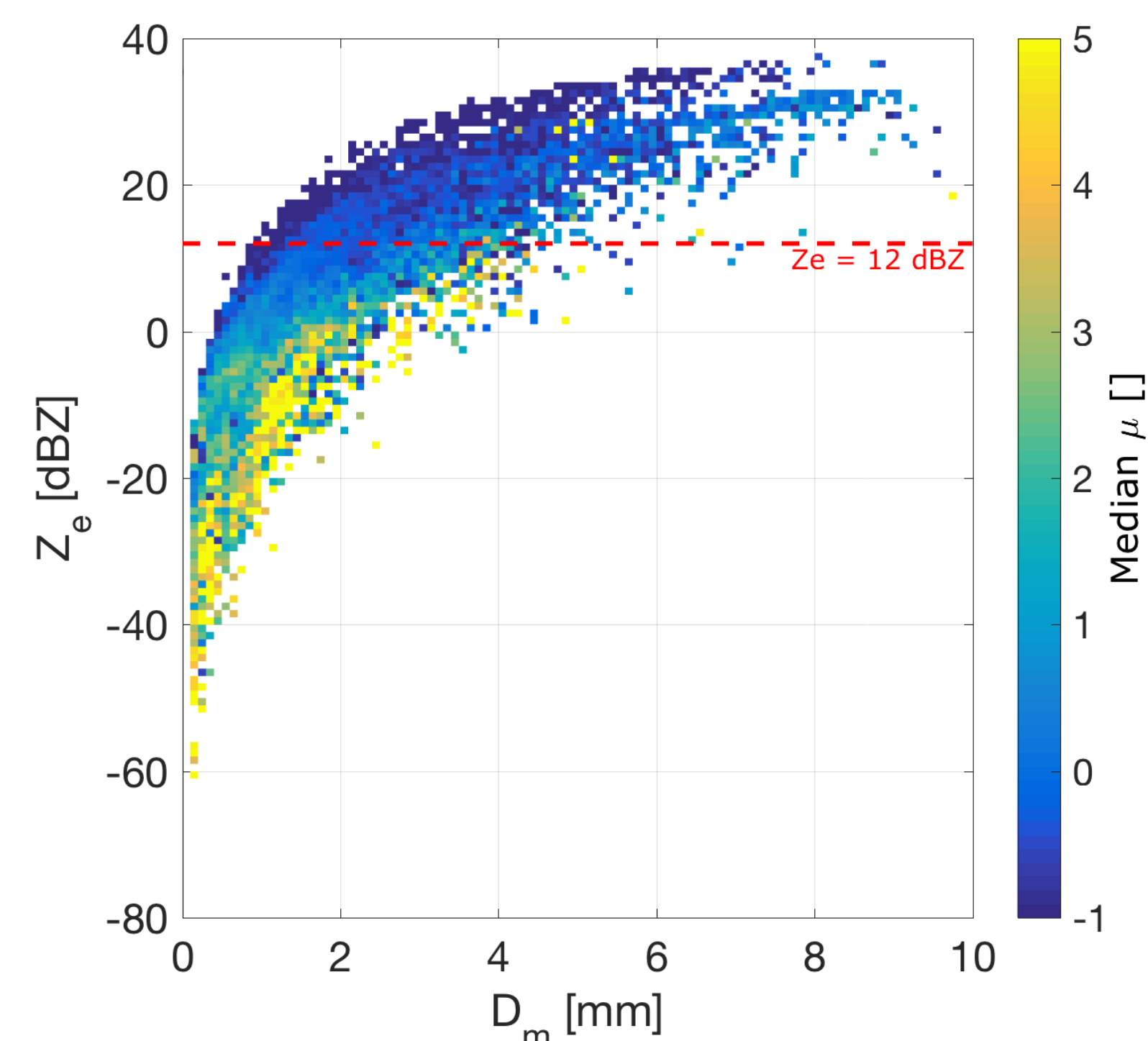
2) Parameterization of mass in ice clouds: *Use observed radar reflectivity factor and PSDs to determine equally-realizable  $a$  and  $b$  coefficients in  $m = aD^b$*  (Finlon et al., in prep)

## $\sigma_m - D_m$ in GCPEX ice only clouds



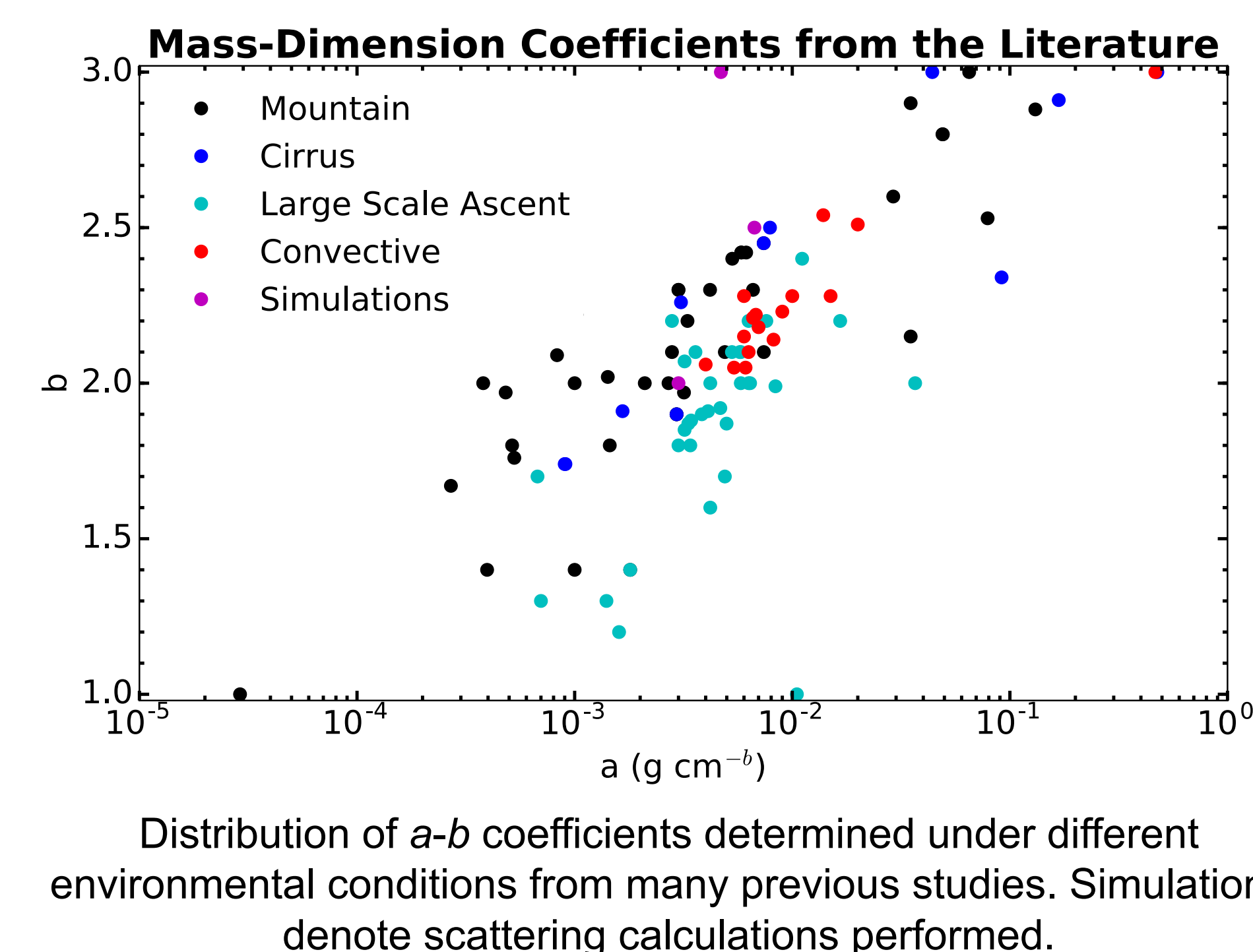
## $Z_e - D_m$ in GCPEX ice only clouds

Radar reflectivity factor ( $Z_e$ , simulated using PSDs,  $0.6^*D_{max}$ , prolate particles at C-Band using Self-Similar Rayleigh Gans - SSRG; Hogan and Westbrook 2014) shows that GPM-detectable  $D_m$  is the minority of points observed by the Citation in ice-only conditions,  $D_m > 1-2$  mm. **Large  $\mu$  found at small  $D_m$  not relevant for GPM retrievals.**



## $m - D$ parameter variability

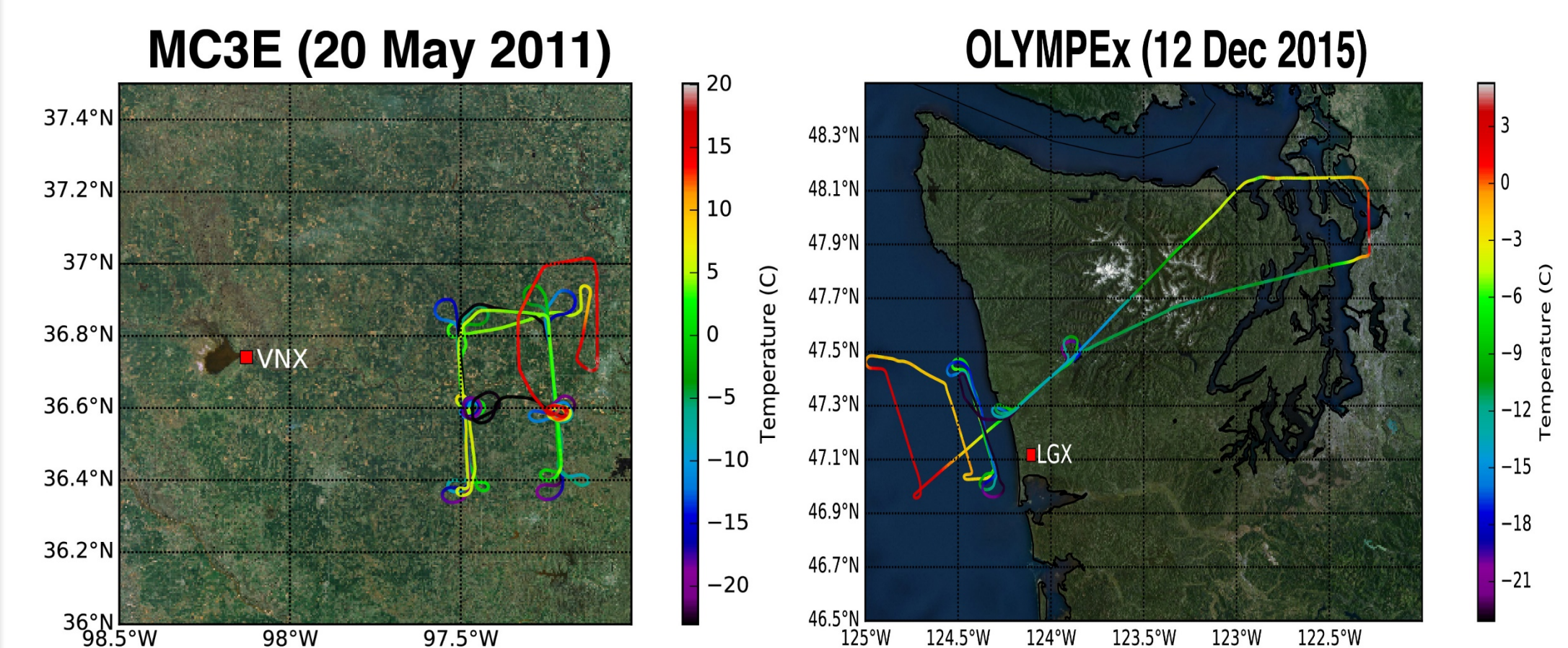
Mass-dimension ( $m - D$ ) relationships relate particle size to mass through  $m = D^b$ . Parameters  $a$  and  $b$  vary with environmental conditions (below), particle shape, processing techniques, and even with probe used to obtain data. Rather than single value of  $a$  and  $b$ , a range of  $a$  and  $b$  may best represent  $m - D$  relationships for remote sensing studies.



## Data from MC3E and OLYMPEx

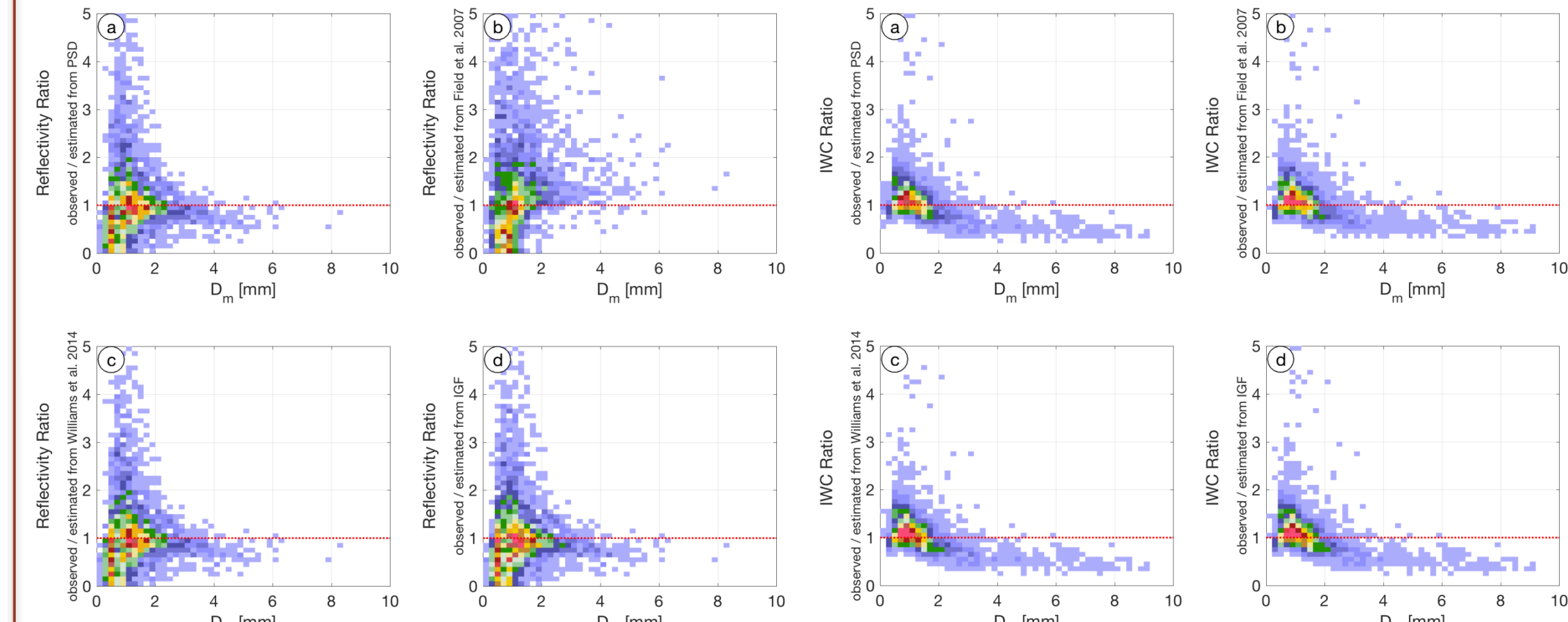
For flight legs plotted below points where radar matching algorithm shows Univ. North Dakota Citation within 500 m of S-band radar gates identified, and radar reflectivity factor ( $Z_e$ ) at aircraft's position determined by our radar matching code.

In MC3E PPI scans from KVNx WSR-88D were used in OLYMPEx, PPI scans from KLGX WSR-88D were used

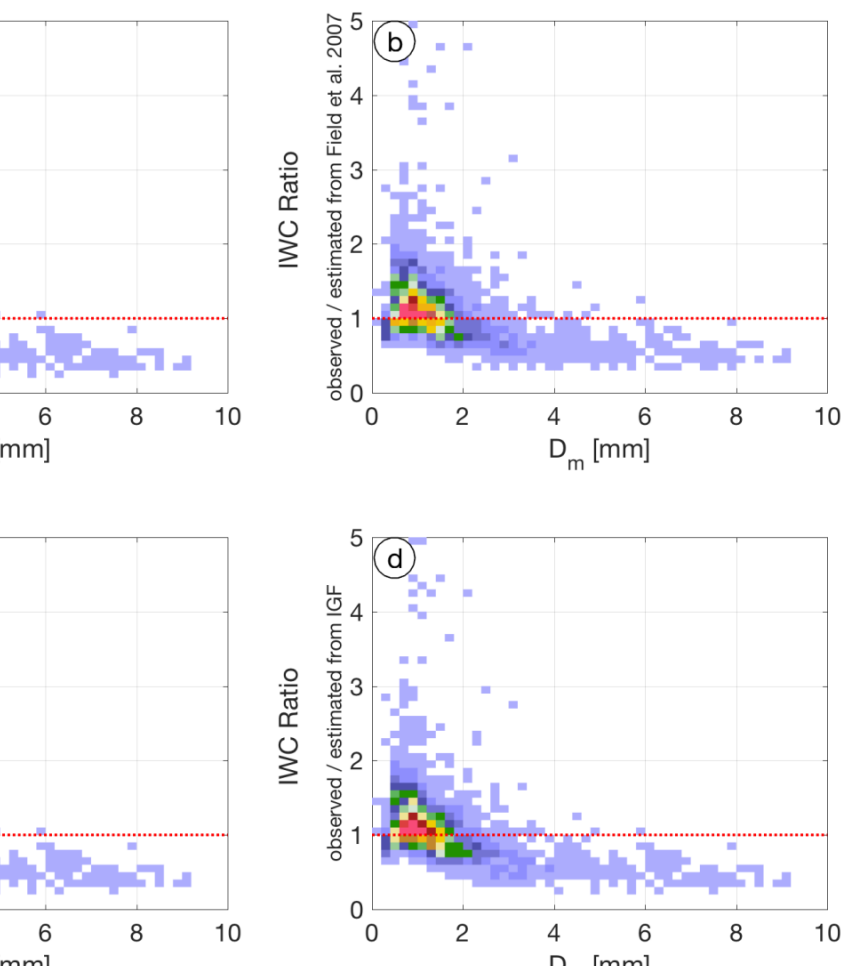


Map of Citation track (colored by temperature) and S-band radar location (red box) for 20 May 2011 of the Mid-Latitude Continental Convective Clouds Experiment (MC3E, left) and 12 Dec 2015 of the Olympic Mountain Experiment (OLYMPEx, right).

### Reflectivity factor



### Ice water content



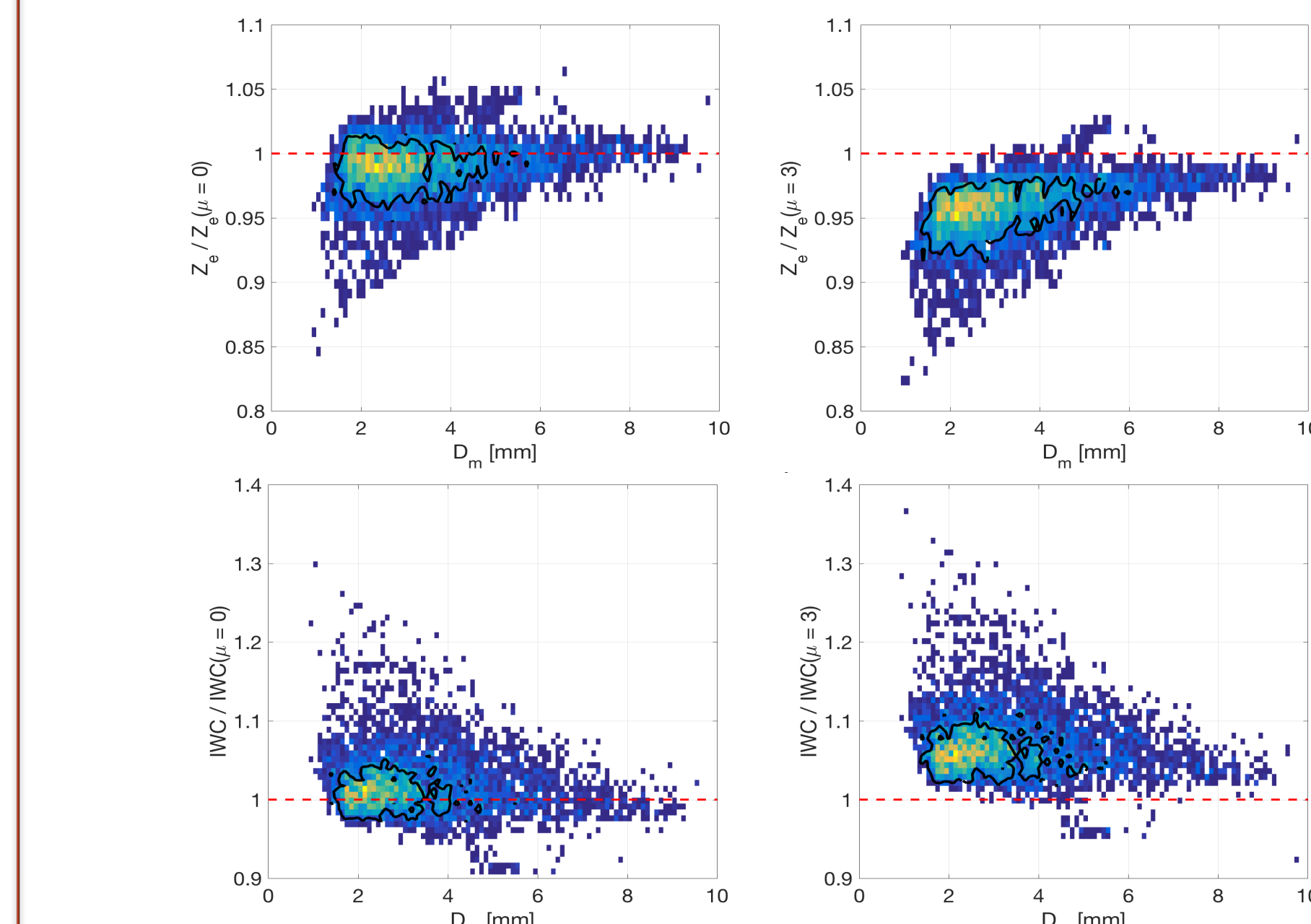
## Comparison of estimated and observed $Z_e$ and ice water content (IWC)

Radar reflectivity factor observed by the Environment Canada King City C-Band radar is compared with C-Band SSRG (expressed as a ratio – left panels), and IWC observed by the Nevzorov probe is compared with the PSD IWC (expressed as a ratio – right panels) as a function of  $D_m$  for 4 PSDs: (a) observed PSDs, (b) Field et al. (2007) parameterization (used in CloudSat snowfall retrievals), (c) moment-based parameterization developed in this study, and (d) incomplete Gamma fit (McFarquhar et al. 2015).

Observed, moment-based, and IGF perform nearly identically. Field et al. (2007) has more scatter and is biased high in  $Z_e$  at  $D_m > 2$  mm. All parameterizations are low in IWC relative to Nevzorov measurements at  $D_m > 2$  mm.

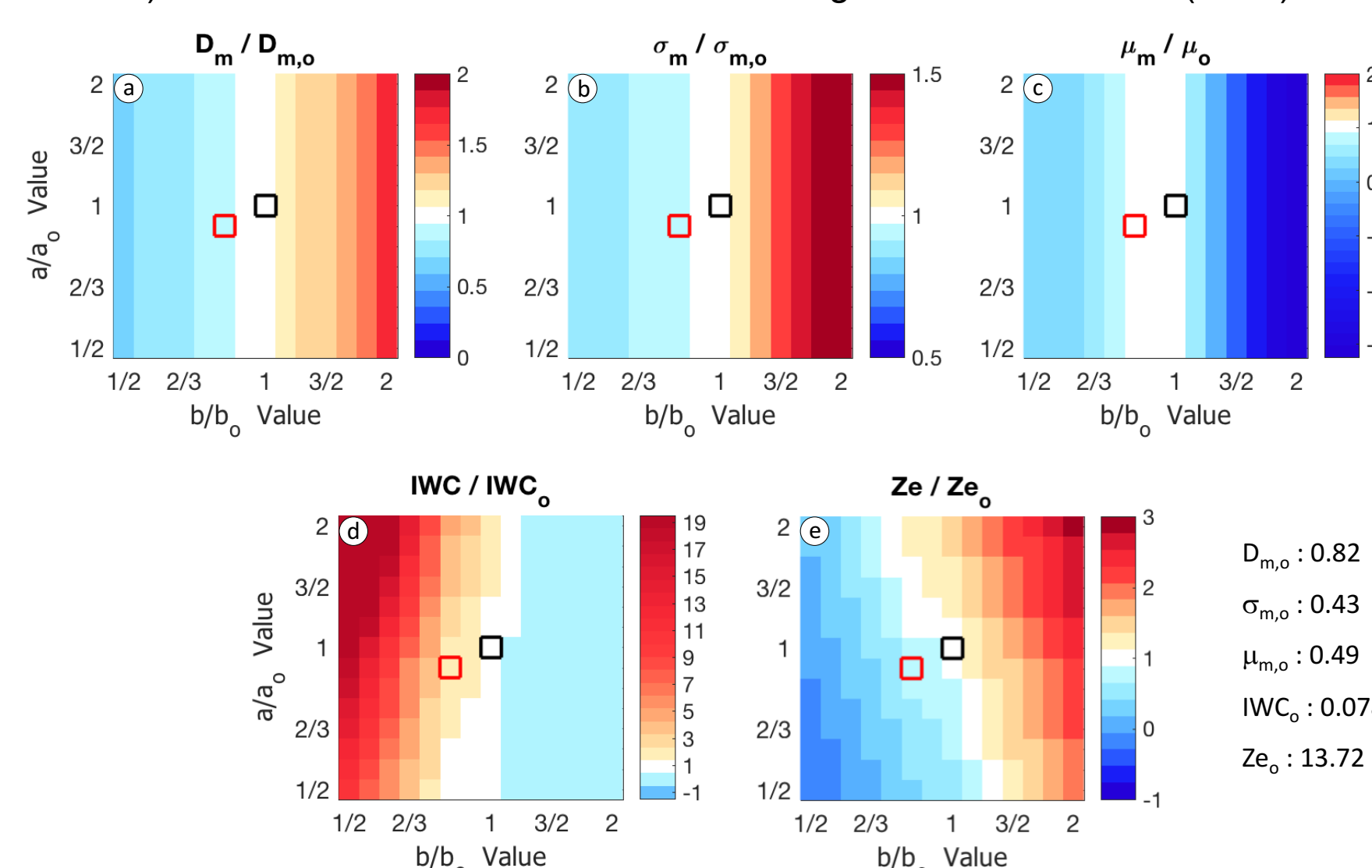
## Impact of $\mu$ on forward-modeled $Z_e$ and IWC

Normalized joint frequency of occurrence of  $Z_e$  with varying  $\mu$  divided by  $Z_e$  estimated with  $\mu$  equal to (a) zero and (b) three versus  $D_m$ . Frequencies larger than 0.25 are enclosed by the solid black line and a zero difference between the estimated and observed variables is marked with a dotted red line.



## Uncertainty due to $a$ and $b$ assumptions

Influence of different  $a$  and  $b$  parameters, via the mass-diameter relation, in (a)  $D_m$ , (b)  $\sigma_m$ , (c)  $\mu$ , (d) IWC, and (e)  $Z_e$ . This effect is quantified by estimating the mass for different  $a$  and  $b$  values (ranging from half to double the values used in this work – ( $a_o, b_o$ )) and calculating the associated moments and variables normalized by the ones using ( $a_o, b_o$ ). Therefore, a value of 2 (0.5) indicates that, for the corresponding ( $a, b$ ) value, there is a 100% positive (50% negative) bias in the estimated variable. The black box shows the values used in this work (( $a_o, b_o$ ) – Heymsfield et al., 2010) and the red box shows the effect of using Brown and Francis (1995) values.



Uses technique similar to McFarquhar et al. (2015) where  $a$  and  $b$  minimizing  $\chi^2$  difference –  $\chi^2_{min}$  – between total water content (TWC) &  $Z_e$  are derived from particle size distributions (PSDs) and measured by Nevzorov TWC probe and S-band radar for each flight leg containing  $N$  collocated observations

Surface of equally realizable  $a$  &  $b$  coefficients in ( $a, b$ ) phase space determined by accepting all coefficients satisfying  $\chi^2(a, b) \leq \chi^2_{min} + \max(\chi^2_{min}, \Delta\chi^2)$ , where  $\Delta\chi^2$  is some tolerance based on statistical uncertainty in measured SDs

The figure at right shows surfaces of equally realizable  $a$  and  $b$  coefficients in ( $a, b$ ) phase space for MC3E (left) and OLYMPEx (right) at different constant temperature environments. Representative particle images from the HVPS3 optical array probe (insets) also shown.

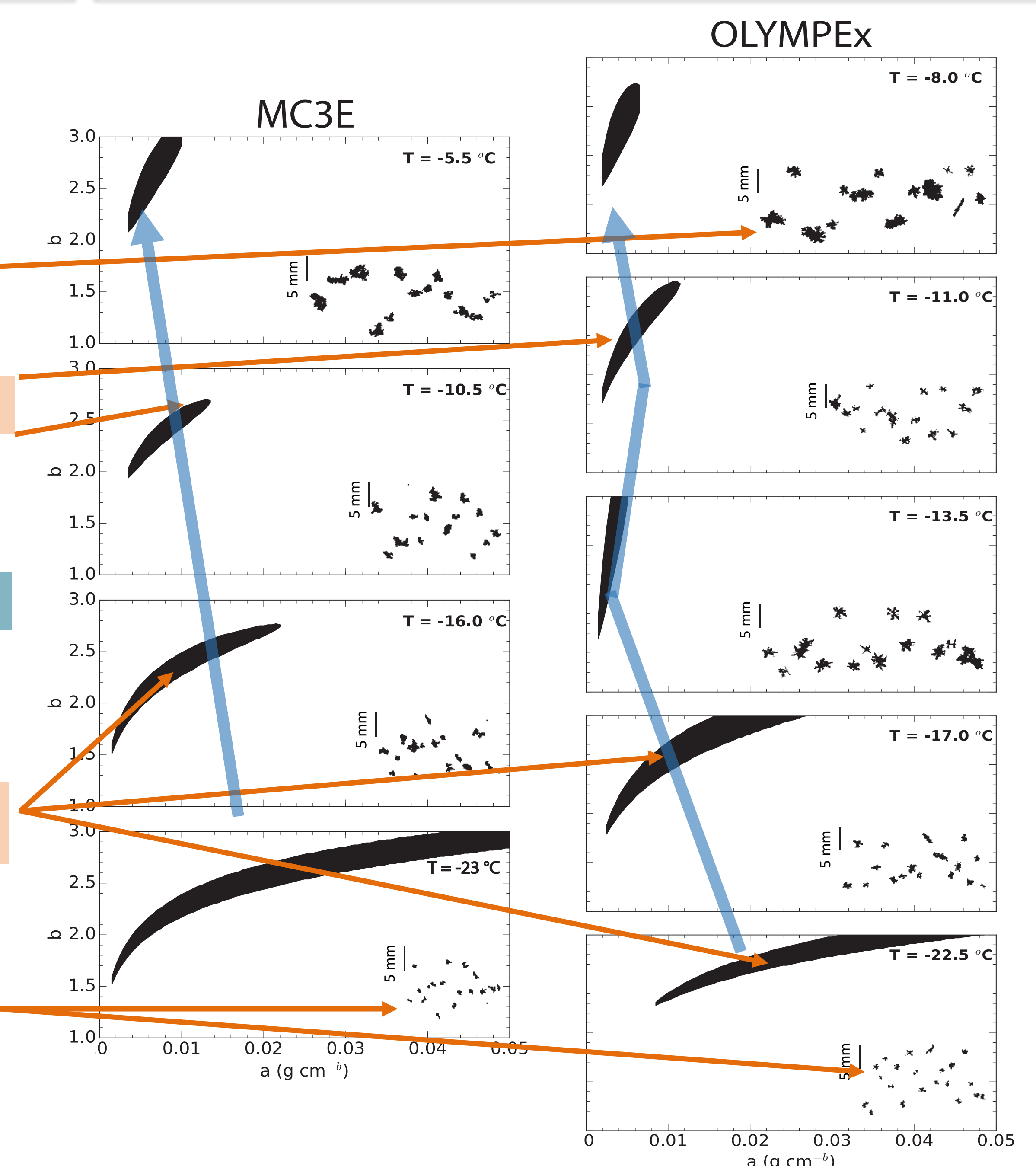
More variability in particle size/shape at greater T consistent with aggregation

Smaller range of  $a$  &  $b$  related to variation in  $Z_e$  and TWC

Trends in  $a$  consistent with trends in bulk density

More  $a$  &  $b$  fit within tolerance when particle sizes less variable

Less variation in particle size at lower T



- Chi-square minimization technique employs novel way of determining range of  $a$ - $b$  solutions describing meteorological conditions & microphysical properties in cloud
- Technique permits stochastic representation of  $m - D$  parameters within microphysical parameterizations & retrieval schemes
- Particle images corroborate trends in radar  $Z_e$  and TWC as a function of temperature, with aggregation more common at higher temperatures and within the dendritic growth zone
- Range of equally realizable  $a$  &  $b$  appear related to relative variability in observed  $Z_e$  and TWC for temperatures and cases analyzed
- Increasing  $a$  values toward lower T agree with bulk density trends in observed stratiform clouds

**Key Points:**

- Parametrization of PSDs using uncorrelated mass parameters gives IWC and  $Z_e$  comparable to the PSD itself, Field et al. (2007) biased
- It is important to allow  $\mu = 0$  in ice at GPM-detectable PSDs
- A parameterization of the PSD using mass parameters (including  $a, b$  uncertainty) is being developed for GPM algorithms

**Key Points:**

## Acknowledgments

Funding from National Aeronautics and Space Administration, Precipitation Measurement Missions (grants: NNX16AB70G and NNX16AD80G) Thanks to Wei Wu, Mike Poellot, Saisai Ding, and Bob Rauber for scientific discussions